

# Adaptive M-QAM Modulation for MIMO Systems

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## I. INTRODUCTION

Adaptive modulation substantially increases the throughput of a wireless network by adjusting the modulation index to the channel conditions. It was shown in [1] that adaptive power and rate M-QAM system can give a power gain of almost 20dB relative to non-adaptive transmission for CDMA systems. A review of adaptive modulation for broadband system was presented in [2].

Multiple-input multiple-output (MIMO) links exploit the spatial dimension and antenna arrays at both ends of a link to transmit multiple parallel streams in the same time and frequency channel [3,4]. The result is an extraordinary bandwidth-efficient approach to wireless communication, especially in rich multi-path environments. V-BLAST [5,6] is a simple and widely considered architecture for open-loop (OL) MIMO systems.

Closed-loop (CL) MIMO systems feedback the channel state information (CSI) to the transmitter to set the antenna weights and transmit powers resulting in decoupled streams and greater capacity than OL-MIMO. The water-filling (WF) algorithm [4] maximizes the CL-MIMO capacity. A MMSE solution that minimizes the BER was proposed in [7]. CL-MIMO has not been favored because of the overhead in relaying the CSI to the transmitter. Although results with simulated channels based on Rayleigh-fading and Doppler models suggest otherwise, it was shown in [8] that if the statistical channel is replaced by more realistic indoor propagation channel model, CL-MIMO can be feasible despite the overhead in especially low-mobility indoor networks.

In this paper we propose algorithms for implementing adaptive M-QAM modulation for both OL- and CL-MIMO systems. The goal is to maximize the throughput subject to a target BER constraint. For OL-MIMO the algorithm proposed finds the number of transmit antennas and the modulation index to be used for all streams. For CL-MIMO, we propose a new rate maximization scheme that, on the average, has 20% throughput improvement over OL-MIMO. We also modify the water-filling and MMSE solutions to accommodate adaptive modulation and BER constraints. We use the flat Rayleigh-fading channel model for our simulations, and assume perfect channel estimation.

This paper is organized as follows: The OL- and CL-MIMO strategies are discussed in Section II. The adaptive M-QAM scheme is discussed in Section III. In Section IV we introduce our adaptive modulation implementations and propose a new rate maximization scheme for CL-MIMO that takes into account the BER threshold. Results and conclusions are presented Section V.

## II. OPEN LOOP AND CLOSED LOOP MIMO STRATEGIES

A MIMO system uses multiple-element transmit and receive antennas to increase the data rate by exploiting the multipaths available. The general capacity formula is given by

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$$C = \max_{\mathbf{P}} \log_2 |\mathbf{I} + \mathbf{H}\mathbf{P}\mathbf{H}'|, \quad (1)$$

where  $\mathbf{H}$  is the channel matrix and  $\mathbf{P}$  is the (noise-normalized) transmit-signal correlation matrix. The noise-normalized total transmit power is given by with  $P_T = \text{trace}\{\mathbf{P}\}$ .

### II.a Open-loop MIMO

In OL-MIMO links, no channel information is used at the transmitter. Each antenna transmits a different data stream with equal power. The V-BLAST system [5,6], employing successive interference cancellation (SIC) and zero forcing, is considered in this paper.

### II.b Water-filling Solution

In CL-MIMO links, channel-dependent matrix transformations at the transmitter and receiver (determined by the sets of right and left singular vectors of  $\mathbf{H}$ ) decompose the matrix channel into a collection of uncoupled parallel channels. The water-filling algorithm [4] given below maximizes the capacity:

$$\alpha_i = \left( \mu - \frac{1}{\lambda_i} \right)^+, \quad \sum_i \alpha_i = P_T. \quad (2)$$

where  $\lambda_i$  is the  $i^{\text{th}}$  channel eigen-mode,  $\alpha_i$  is the power allocated to the stream,  $\mu$  is a Lagrange multiplier, and  $(\cdot)^+$  indicates that only non-negative values are acceptable.

### II.c Closed-loop MMSE Strategy

An optimal solution for CL-MIMO links based on the mean-square error criterion is given in [7], with the power allocation strategy

$$\alpha_i = \left( \frac{\mu}{\sqrt{\lambda_i}} - \frac{1}{\lambda_i} \right)^+, \quad \sum_i \alpha_i = P_T. \quad (3)$$

This is also known as the inverse water-filling (IWF) because it allocates more power to the weaker streams in use to minimize the BER, in contrast to the water-filling solution.

## III. ADAPTIVE MODULATION

Adaptive modulation increases the throughput of a wireless network by matching the transmission rate to the channel conditions. We consider square M-QAM adaptive modulation scheme. We adopt the approximations to the BER given in [9] as

$$BER \approx 0.2 \exp \left[ - \frac{3}{2(M-1)} \frac{E_s}{N_o} \right], \quad (4)$$

where  $E_s$  is the symbol energy,  $N_o$  is the noise power and  $M$  is the modulation index. With  $\gamma$  as maximum tolerable BER, the modulation index for the  $i^{\text{th}}$  stream is obtained by rounding down

$$M_i = 1 - \frac{2}{3} \left( \frac{E_s}{N_o} \right)_i \frac{1}{\ln(5\gamma)} \quad (5)$$

to the nearest practical modulation index. The factor  $(E_s/N_o)_i$  denotes the SNR of the  $i^{\text{th}}$  data stream.

## IV. ADAPTIVE MODULATION FOR MIMO SYSTEMS

In this section we implement adaptive modulation for OL- and CL-MIMO systems and introduce a new closed loop rate maximization scheme that takes into account the target BER during calculation of the power allocation.

#### IV.a *M-QAM based OL- MIMO System*

With equal powers allocated to all transmit antennas and no transmit beamforming, the goal is to find how many streams (transmit antennas) and what modulation index can be employed using the given transmit power and the BER constraint. With the SIC algorithm, the receiver weights to detect a signal in the 1<sup>st</sup> layer,  $\mathbf{w}$ , is minimum-norm row of the pseudo-inverse of  $\mathbf{H}$ . If  $n_T$  transmit antennas are used, then the SNR of the first layer is

$$\frac{E_s}{N_o} = \frac{P_T}{n_T \|\mathbf{w}\|^2}, \quad (6)$$

Substituting (6) in (4) and using  $M = 4$  (smallest QAM index) we find the largest value of  $n_T$  for the target BER. Once  $n_T$  is calculated, the modulation index is calculated using (5). Note that with SIC, the first layer has the worst BER; the successive layers are detected after canceling interference from detected streams. Thus looking at the first layer ensures that all streams (with the same modulation index) will satisfy the BER constraint.

#### IV.b *M-QAM Based WF and IWF Solutions for CL-MIMO*

The water filling and MMSE solutions maximize the capacity and minimize the BER, respectively. But both do not guarantee a target BER. The BER of each individual stream is different and if an average target BER is to be satisfied the stronger streams have to sacrifice their transmission rate in order to lower the BER. This makes both solutions unsuitable for adaptive modulation. In this section we propose a modification to both WF and IWF algorithms in order to maximize the throughput while maintaining a target BER.

The constraint in the WF and IWF strategies is that the Lagrange multiplier is accepted only if the power allocated to the weakest eigen-mode is greater than zero, i.e.,  $\alpha_i > 0$  where  $i$  is the weakest eigen-mode of the subset of eigen-modes being considered. We add the following constraint to satisfy the BER threshold for each stream:

$$\alpha_i \lambda_i > -\frac{9}{2} \ln(5\gamma) \quad (7)$$

This constraint makes sure that the weakest eigen mode can transmit at least QPSK for the given bit error rate threshold ensuring that the stronger streams need not sacrifice the transmission rate in order to maintain overall BER.

#### IV.c *Rate Maximization Scheme*

In this section we present a new rate maximization scheme that takes BER into account while calculating capacity. If adaptive modulation is used then the throughput is given by

$$C = \sum_i \log_2(M_i), \quad (8)$$

where  $M_i$  is the modulation index used for stream  $i$ . Substituting (5) in (8),

$$C = \sum_i \log_2 \left( 1 - \frac{2}{3 \ln(5\gamma)} \alpha_i \lambda_i \right). \quad (9)$$

The power allocation strategy is found as

$$\alpha_i = \left( \mu - \frac{1}{\lambda_i} \frac{3 \ln(5\gamma)}{2} \right)^+ \text{ s. t. } \begin{cases} \sum \alpha_i = P_t \\ \alpha_i \lambda_i > -\frac{9}{2} \ln(5\gamma) \end{cases} \quad (10)$$

### V. RESULTS AND CONCLUSION

Figures 1 and 2 show the average throughput and average number of streams used vs. SNR, respectively. All simulations assume a target BER of  $10^{-2}$  and a 4x4 system. It can

be seen that above 20dB the rate maximization and modified WF have greater throughput than IWF and OL-MIMO. This is because the two schemes adopt a more conservative approach in allocating power to the streams and hence the stronger streams can take better advantage of adaptive modulation. On an average they show 20% improvement over open loop and 14% improvement over the IWF. In the 5 to 10 dB range, all schemes have almost identical throughput because the number of streams allocated by all the schemes are similar and the SNR is not high enough to take advantage of adaptive modulation. In the 0 to 5 dB range the throughput of closed loop is better than open loop because it is able to take advantage of the channel conditions.

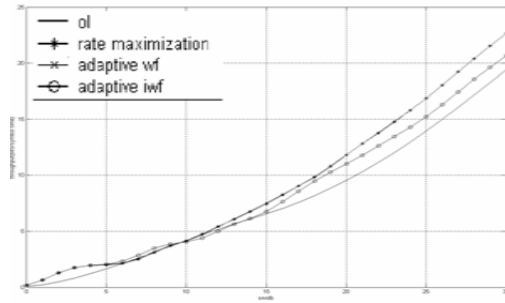


Fig. 1 Throughput of the 4 schemes discussed in section IV. The x-axis is SNR and y-axis is the throughput per symbol time.

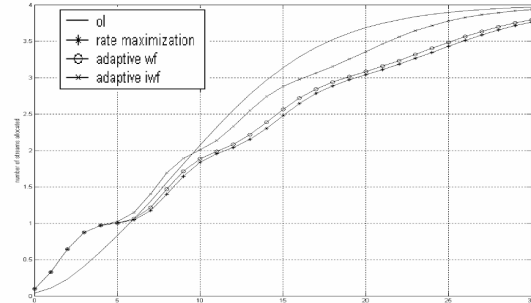


Fig. 2 Average number of streams used by the 4 schemes plotted for varying SNR. The system has 4 transmit and 4 receive antennas

A new adaptive MQAM modulation based rate maximization algorithm was developed for CL-MIMO and V-BLAST algorithm was modified for OL-MIMO systems. Compared to the OL-MIMO system, the new rate-adaptive closed-loop system showed a throughput improvement of almost 20% at 20dB and above. When seen in conjunction with results in [8], we conclude that CL-MIMO is a practical option for indoor high speed wireless networks. Further research issues include investigation of scheduling based on channel conditions in addition to conventional issues and studying effects of interfering MIMO links when adaptive modulation is used.

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